

Extended Tables and Figures for

Climate mitigation potentials of teleworking are sensitive to changes in lifestyle and workplace rather than ICT usage

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Extended methods

Life cycle inventory for residential energy use:

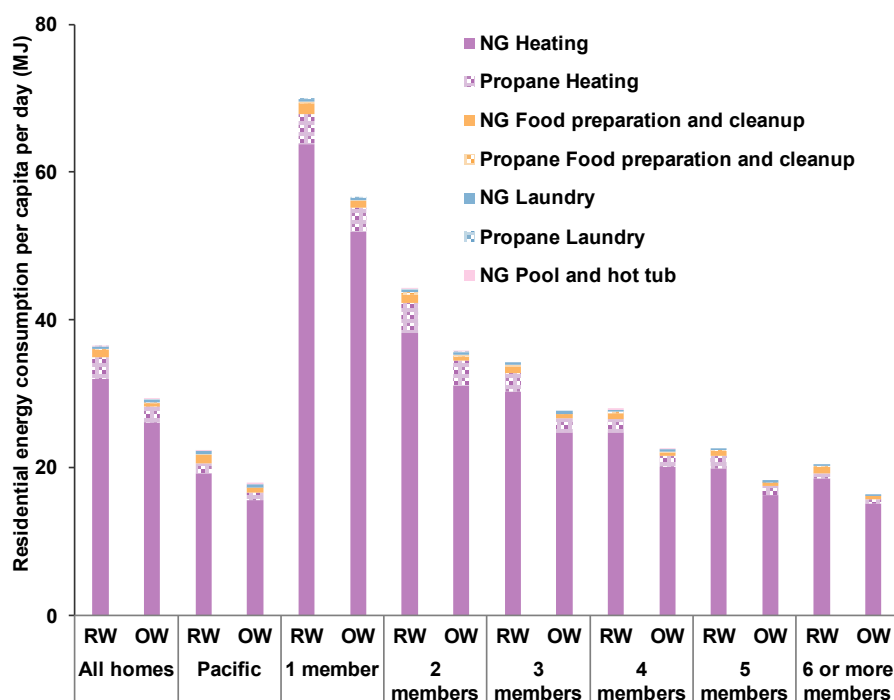


Fig. S1. Average residential energy consumption for remote and onsite work with 1-6 members in the household.

Table S1. Time use and energy use by work mode and home energy end use for the Pacific region (1, 2).

| Aggregated home energy end use | Time use (hour) | | Natural gas (MJ) | | Propane (MJ) | | Electricity (kWh) | | Assumption |
|--------------------------------|-----------------|-------|------------------|-------|--------------|------|-------------------|------|---|
| | RW | OW | RW | OW | RW | OW | RW | OW | |
| Heating | 15.88 | 12.93 | 19.18 | 15.62 | 1.38 | 1.01 | 2.17 | 0.18 | Allocated to the time when people is at home |
| Cooling | 15.88 | 12.93 | | | | | 0.18 | 0.14 | |
| Air conditioning | 15.88 | 12.93 | | | | | 0.67 | 0.55 | |
| Humidifying and dehumidifying | 15.88 | 12.93 | | | | | 0.07 | 0.05 | |
| Lighting | 15.88 | 12.93 | | | | | 0.85 | 0.51 | |
| Laundry | | | 0.45 | 0.45 | | | 0.43 | 0.43 | Assume same |
| Refrigerators | 24.00 | 24.00 | | | | | 0.89 | 0.89 | 24-hour operation |
| Food preparation | 0.43 | 0.23 | 1.12 | 0.61 | 0.10 | 0.08 | 0.28 | 0.15 | Allocated to the time when people do food preparation and cleanup |
| TVs | 0.43 | 0.23 | | | | | 0.41 | 0.38 | Allocated to the time when people watch TV |
| Pool and hot tub | 0.43 | 0.23 | 0.19 | 0.23 | | | 0.10 | 0.13 | Allocated to the time when people relax |

Life cycle inventory for office energy use:

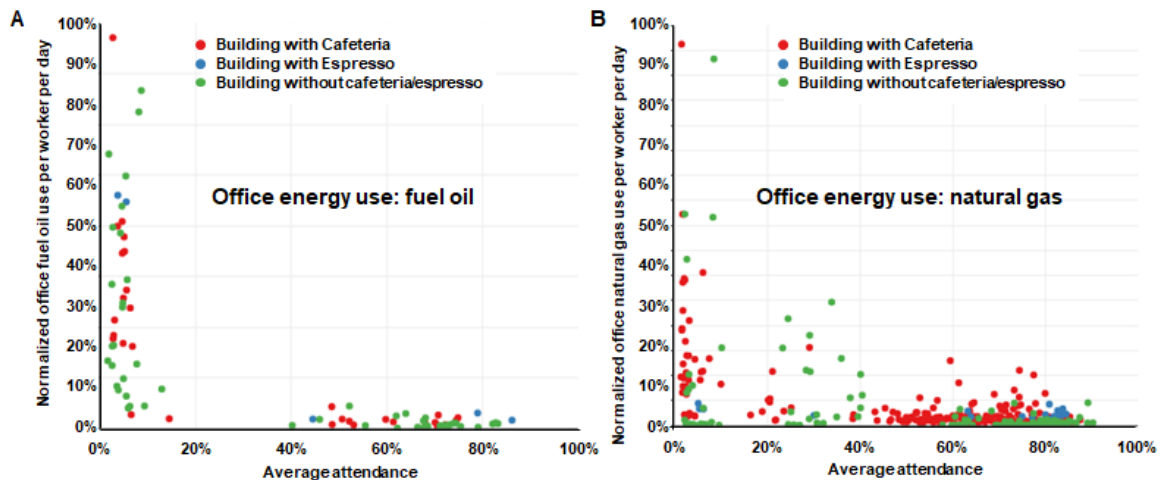


Fig. S2. Nonlinear relationships between building attendance, the existence of a cafeteria, and office energy use for (A) fuel oil and (B) natural gas.

Table S2. Results of model fitting for nonlinear relationships between building attendance, building headcount, the existence of a cafeteria, and office energy use.

| Coefficients | Estimate | Std. Error | t value | Pr(> t) |
|---|-----------|------------|---------|----------|
| Intercept (<i>a</i>) | 3.28 | 0.081 | 40.49 | < 2E-16 |
| Log(%Building attendance) (<i>b</i>) | -0.92 | 0.027 | -33.60 | < 2E-16 |
| Dummy variable of Café (<i>c</i>) | 0.24 | 0.062 | 3.81 | 0.00016 |
| Headcount (<i>d</i>) | -3.30E-04 | 6.64E-05 | -4.97 | 1.03E-06 |
| $Energy\ use = e^{a+c \cdot Cafe_dummy+d \cdot Headcount} \cdot (\% Building\ attendance)^b$ | | | | |

Table S3. Methodology for calculating non-occupancy and occupancy-related energy use. The parameter *a* indicates the number of people sharing one seat.

| Scenario | Non-occupancy-related energy use (<i>x</i> per seat per workday) | Occupancy-related energy use (<i>y</i> per capita per day) | Total office energy use (<i>z</i>) |
|----------|---|---|---|
| RW (OW0) | 0 | 0 | $z = 0$ |
| OW (OW5) | $5 \cdot x$ | $5 \cdot y$ | $z = 5 \cdot (x + y)$ |
| HW (OW1) | $5 \cdot \frac{1}{a} \cdot x$ | $1 \cdot y$ | $z = 5 \cdot \frac{1}{a} \cdot x + 1 \cdot y$ |
| HW (OW2) | | $2 \cdot y$ | $z = 5 \cdot \frac{1}{a} \cdot x + 2 \cdot y$ |
| HW (OW3) | | $3 \cdot y$ | $z = 5 \cdot \frac{1}{a} \cdot x + 3 \cdot y$ |
| HW (OW4) | | $4 \cdot y$ | $z = 5 \cdot \frac{1}{a} \cdot x + 4 \cdot y$ |

Life cycle impact assessment:

Table S4. Characterization factors collected from Ecoinvent database (version 3.9.1) (3).

| Item | Ecoinvent process | Region | Amount | Unit | GWP100 (IPCC 2013; kg CO2 eq.) |
|---------------------------------|---|---------|--------|-----------|---|
| Propane production | market for propane | GLO | 1 | kg | 1.12 |
| Home heating, natural gas | market group for heat, central or small-scale, natural gas | GLO | 1 | MJ | 0.079 |
| Home and office electricity use | market group for electricity, low voltage | US-WECC | 1 | kWh | 0.38 |
| Transport, small size ICEV | market for transport, passenger car, small size, petrol, EURO 5 | GLO | 1 | km | 0.30 |
| Transport, medium size ICEV | market for transport, passenger car, medium size, petrol, EURO 5 | GLO | 1 | km | 0.37 |
| Transport, large size ICEV | market for transport, passenger car, large size, petrol, EURO 5 | GLO | 1 | km | 0.44 |
| Transport, train | market for transport, passenger train | GLO | 1 | person*km | 0.075 |
| Transport, bus | market for transport, regular bus | RoW | 1 | person*km | 0.12 |
| Transport, EV | transport, passenger car, electric | GLO | 1 | km | 0.23 |
| Office heating, light fuel oil | heat production, light fuel oil, at boiler 100kW condensing, non-modulating | RoW | 1 | | 0.095 |
| Office heating, natural gas | heat production, natural gas, at boiler condensing modulating <100kW | RoW | 1 | MJ | 0.072 |
| Transport, airplane | market for transport, passenger aircraft, unspecified | GLO | 1 | person*km | 0.12 |
| Transport, bicycle | market for transport, passenger, bicycle | GLO | 1 | person*km | 0.012 |
| Transport, motorcycle | market for transport, passenger, motor scooter | GLO | 1 | person*km | 0.17 |

Sensitivity analysis:

Table S5. Modified emission factors for projected EV scenarios (4).

| | Emission factors for electricity (kg CO ₂ eq./kWh) | | | | EV transport emission factors (kg CO ₂ eq./mile) | | | |
|---------------------------|--|-------|-------|-------|--|-------|-------|-------|
| | 2023 | 2030 | 2040 | 2050 | 2023 | 2030 | 2040 | 2050 |
| US regions | | | | | | | | |
| US average | 0.364 | 0.193 | 0.163 | 0.145 | 0.203 | 0.148 | 0.139 | 0.133 |
| New England | 0.190 | 0.096 | 0.096 | 0.079 | 0.147 | 0.117 | 0.117 | 0.112 |
| Middle Atlantic | 0.362 | 0.273 | 0.222 | 0.198 | 0.202 | 0.174 | 0.157 | 0.150 |
| East North Central | 0.429 | 0.215 | 0.202 | 0.172 | 0.224 | 0.155 | 0.151 | 0.141 |
| West North Central | 0.456 | 0.163 | 0.160 | 0.145 | 0.232 | 0.139 | 0.137 | 0.133 |
| South Atlantic | 0.341 | 0.188 | 0.172 | 0.140 | 0.196 | 0.146 | 0.141 | 0.131 |
| East South Central | 0.511 | 0.276 | 0.226 | 0.197 | 0.250 | 0.175 | 0.159 | 0.149 |
| West South Central | 0.344 | 0.186 | 0.148 | 0.144 | 0.196 | 0.146 | 0.134 | 0.132 |
| Mountain | 0.504 | 0.209 | 0.133 | 0.143 | 0.248 | 0.153 | 0.129 | 0.132 |
| Pacific | 0.122 | 0.099 | 0.072 | 0.058 | 0.125 | 0.118 | 0.109 | 0.105 |

Extended results and discussion

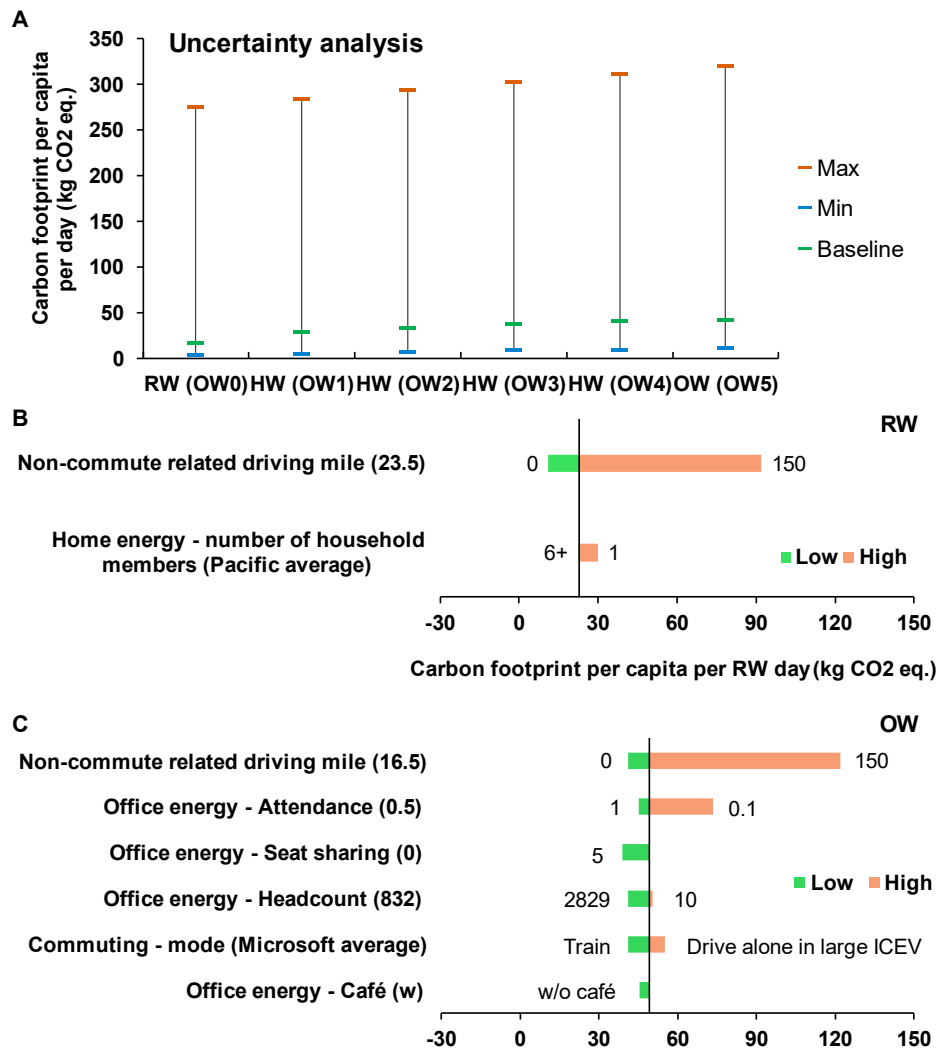


Fig. S3. Variation in the GHG emissions of the six remote work scenarios and sensitivity analyses. (A) uncertainty analysis, (B) sensitivity analysis for the fully remote work scenario, (C) sensitivity analysis for the fully onsite work scenario.

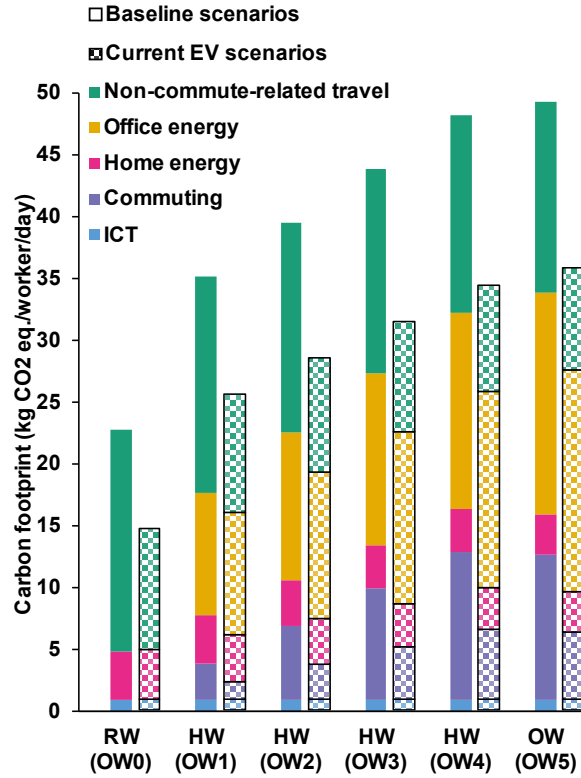


Fig. S4. Sensitivity analysis of electric vehicle (EV) use in the life cycle stage of commuting and non-commute-related travel. Breakdown of life cycle carbon footprint for ICT, commuting, home energy, office energy, and non-commute-related travel for all six baseline remote work scenarios and six current EV scenarios are presented in the figure. In the current EV scenarios, we assume that EV are used exclusively as passenger car for both commuting and non-commute-related travel with default setting of global power supply from the Ecoinvent database. Acronyms: electric vehicle (EV), information and communication technology (ICT), remote worker (RW), hybrid worker (HW), onsite work/onsite worker (OW).

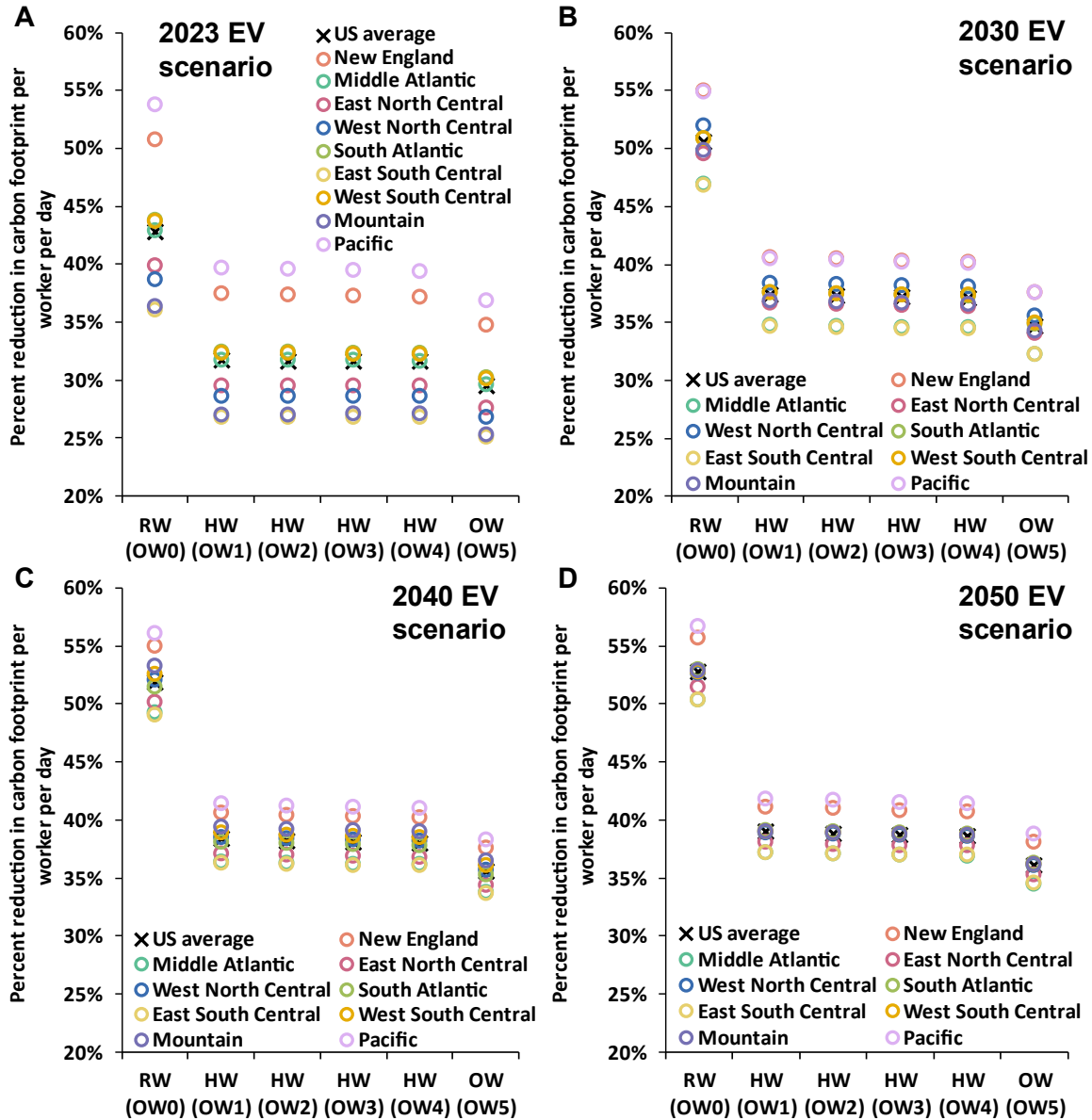


Fig. S5. Temporal and spatial variation in electric vehicle use in the life cycle stage of commuting and non-commute-related travel. Percent reduction in carbon footprint per worker per day for six projected EV scenarios in 2023 (A), 2030 (B), 2040 (C), and 2050 (D), relative to their corresponding 2020 EV scenarios. Acronyms: electric vehicle (EV), remote worker (RW), hybrid worker (HW), onsite work/onsite worker (OW), United States (US).

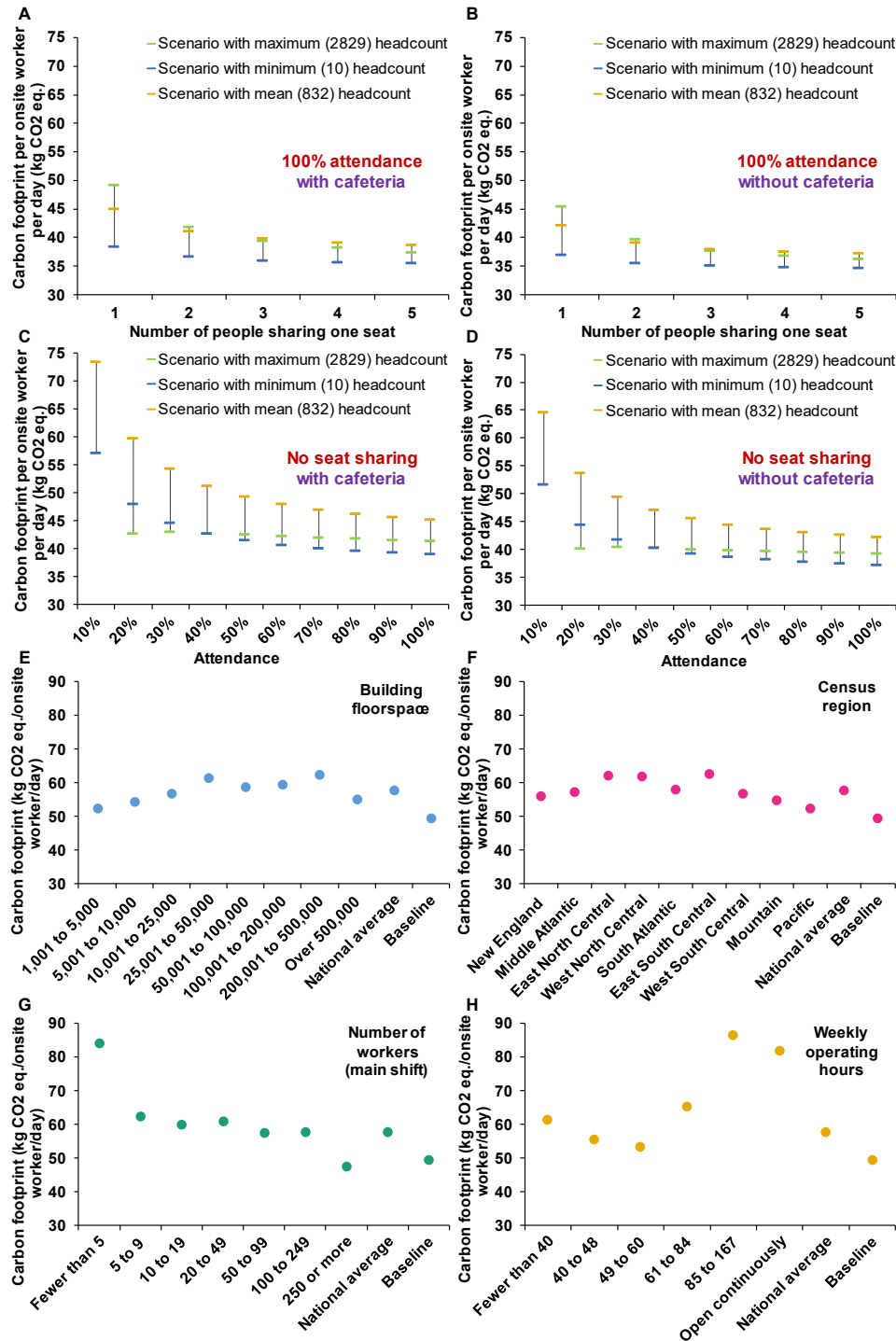


Fig. S6. Sensitivity analyses on the variables related to office energy use. (A-B) show variation in life cycle carbon footprint per onsite worker per day to seat sharing and building headcount, with respect to the assumption of full building attendance. The assumption regarding the existence of cafeteria differs for (A) with cafeteria (B) without cafeteria. (C-D) show variation in life cycle carbon footprint per onsite worker per day to building attendance and headcount, with respect to the baseline assumption of no seat sharing. The assumption regarding the existence of cafeteria differs for (C) with cafeteria (D) without cafeteria. (E-H) show variation in life cycle carbon footprint per onsite worker per day to (E) building floorspace, (F) census region, (G) number of workers during the main shift, and (H) weekly operating hours, based on the 2018 CBECS data.

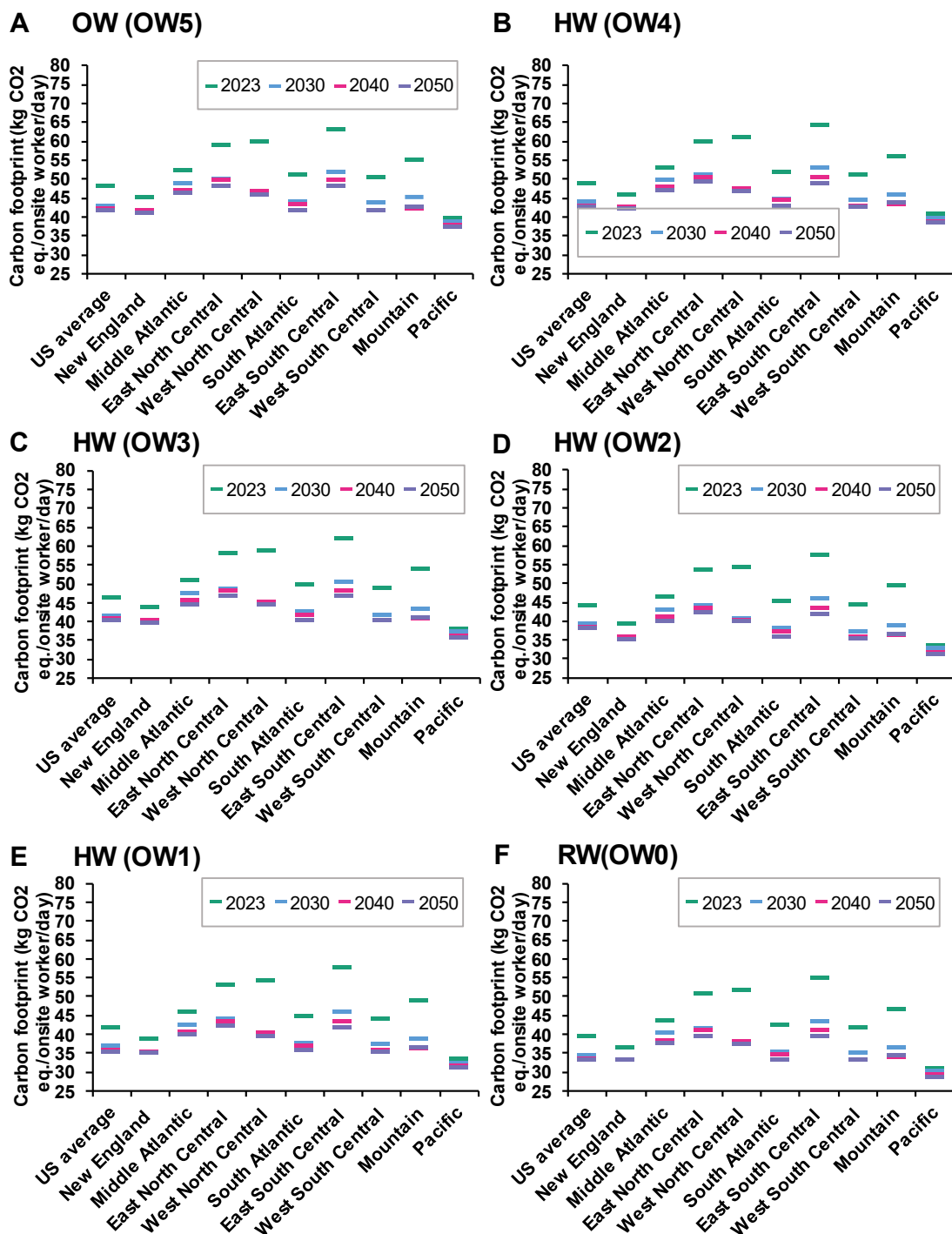


Fig. S7. Sensitivity analyses and temporal and spatial variation of the variables related to office energy use. Life cycle carbon footprint per onsite worker per day for the six scenarios of (A) OW (OW5), (B) HW (OW4), (C) HW (OW3), (D) HW (OW2), (E) HW (OW1), and (F) RW(OW0) according to the projected emissions of US census regions. Acronyms: United States (US).

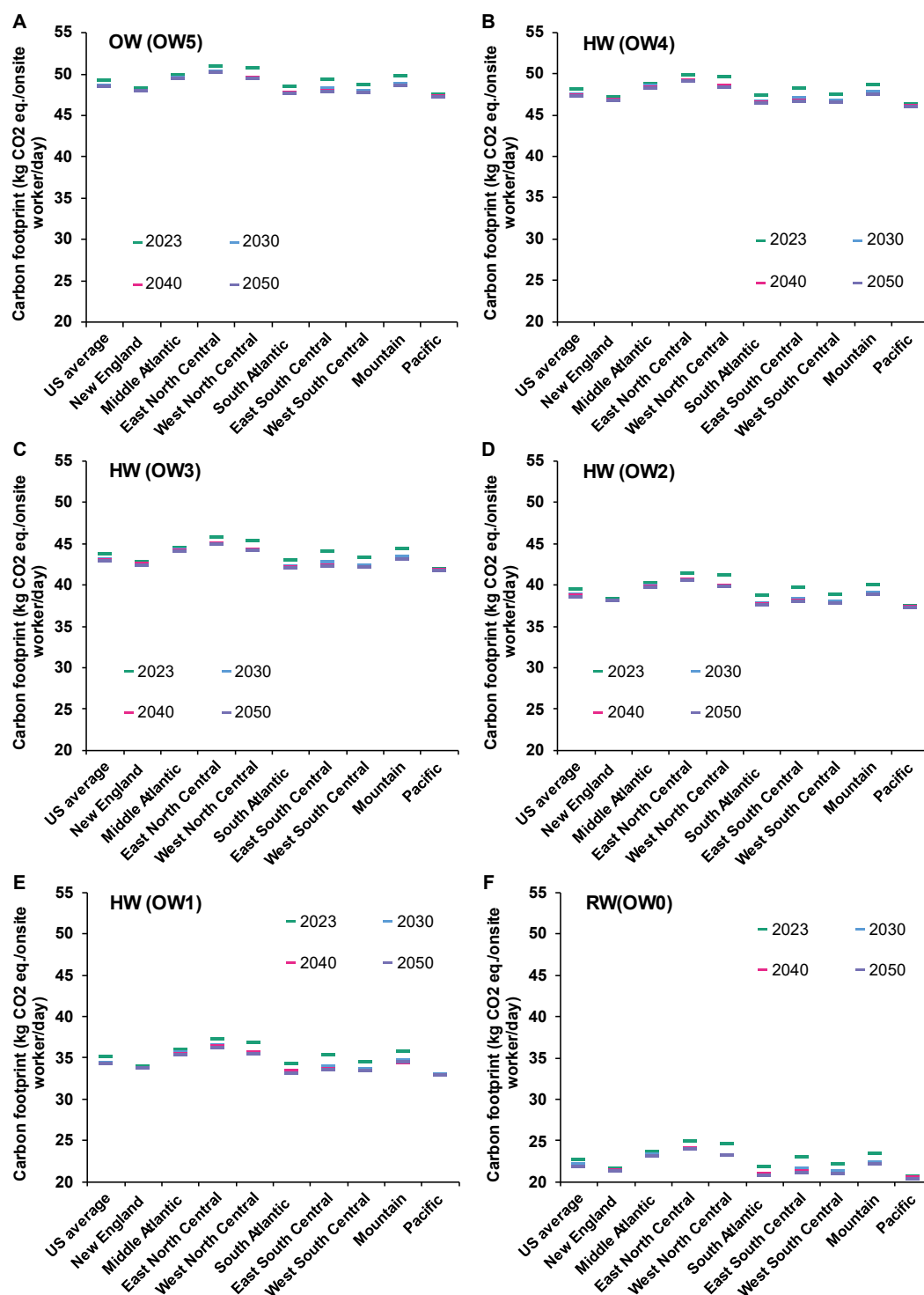


Fig. S8. Temporal and spatial variation of the variables related to home energy use. Life cycle carbon footprint per onsite worker per day, according to the projected emissions of US power grids in (A) 2030, (B) 2040, and (C) 2050. (D-F) show temporal and spatial variation in life cycle carbon footprint per remote worker per day for the six scenarios of (A) OW (OW5), (B) HW (OW4), (C) HW (OW3), (D) HW (OW2), (E) HW (OW1), and (F) RW(OW0) according to the projected emissions of US census regions. Acronyms: remote worker (RW), onsite work/onsite worker (OW), United States (US).

SI References

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